

SLIDING WINDOW TECHNIQUE FOR FOREST FIRE PREDICTION

This thesis is submitted to the Division of Applied Sciences, College of Arts and
Sciences in partial fulfilment of the requirements for the degree of
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ABSTRAK

Kebakaran hutan di Portugal setiap tahun mengakibatkan kemusnahan kawasan tanah yang luas serta kematian. Dalam penyelidikan ini, kaedah penemuan corak digunakan untuk mencari corak kebakaran yang mengaitkan di antara keadaan meteorologi dan saiz kebakaran hutan. Faktor meteorologi yang disiasat merangkumi suhu, kelembapan udara, kelajuan angin dan hujan. Teknik *sliding window* digunakan untuk mencari corak kebakaran untuk keadaan cuaca yang mempunyai kaitan dengan kejadian kebakaran hutan. Set data awal diolah dengan menukar nilai selanjar ke nilai kategori. Teknik *sliding window* kemudiannya digunakan untuk mencari corak kebakaran. Corak yang ditemui dikumpulkan mengikut saiz kawasan kebakaran. Dapatan kajian menunjukkan lapan *rules* yang boleh digunakan untuk menjangkakan saiz kebakaran hutan. Di samping itu, penyelidikan ini menunjukkan bahawa teknik *sliding window* juga boleh digunakan bagi set data yang tidak berupa *temporal*.

ABSTRACT

Every year, forest fire in Portugal causes large areas of land being destroyed and there are cases of death. In this research pattern discovery is being used to generate patterns of meteorological conditions in relation to area burnt of forest fire. The meteorological conditions that are being investigated are temperature, relative humidity, wind speed and rainfall. The combination of these four conditions forms the patterns that are of interest in this research. The sliding window technique is being used to generate patterns for meteorological conditions that are significant to forest fire. The initial dataset is being transformed by changing the continuous values of the attributes into categorical values of the attributes. The patterns are then being generated through the sliding window methodology. Patterns that could not be validated are being regarded as invalid and thus are discarded while the patterns that could be validated are taken for further analysis. Patterns that are valid are then being grouped based on the burnt area associated with a pattern. The rules are then generated by transforming the categorical values into intervals and the merging of different records into the same rules. The rule generation stage produces eight distinct patterns of meteorological conditions that could predict the size of forest fire. In addition, this study showed that the sliding window technique could be used in non-temporal data.

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LIST OF ABBREVIATIONS

ABBA	Automated Biomass Burning Algorithm
ASTER	Advanced Spaceborne Thermal Emission and Reflection Radiometer
BIRD	Bi-Spectral InfraRed Detection
BUI	Buildup Index
CFFDRS	Canadian Forest Fire Danger Rating System
DC	Drought Code
DM	Data Mining
DMC	Duff Moisture Code
DNA	Deoxyribonucleic Acid
ERS	European Earth Resource Satellite
FARSITE	Fire Area Simulator
FFI	Finnish Forest Fire Risk Index
FFMC	Fine Fuel Moisture Code
FWI	Fire Weather Index
GIS	Geographic Information Systems
GOES	Geostationary Operational Environmental Satellite
HMM	Hidden Markov Model
ICRIF	Indice Combinado de Risco de Incendio Florestal (Forest Fire Risk Index)
ISI	Initial Spread Index
MODIS	The Moderate Resolution Imaging Spectroradiometer
MSG	Meteosat Second Generation

NDVI	Normalized Difference Vegetation Index
RADARSAT	Radar Satellite
SAR	Synthetic Aperture Radar
SEVIRI	Spinning Enhanced Visible and Infrared Imager
SNP	Single Nucleotide Polymorphism
SVM	Support Vector Machine

CHAPTER 1

INTRODUCTION

Forest fire plays a crucial role in shaping forest ecosystems all over the world. In Mountain Ash forests in Australia, for example, the regeneration of the ecosystems depends on fire. However, other forest ecosystems such as tropical lowland and peat forest are most likely to be seriously damaged by fire. There is increasing evidence to show that the link between climate change and El Nino phenomenon is causing an escalation in number and size of forest fire. According to new evidence from Amazon, tropical forests that have experienced burning before would be more susceptible to future burning. Thus, there is an increased possibility that wildfire episodes will occur more frequently, and in the magnitude not endurable by the tropical forest ecosystem. Scientists believed that the entire Amazon would be threatened, and the consequence affects the biodiversity and climate change globally (Rowell & Moore, 2000).

During the El Niño phenomenon in the late 1997 and early 1998, the major forests throughout the world were experiencing burning, causing severe damages to the environment as well as economy. It was a time where South East Asia, South and Central America, Europe, Russia and China were raged with fire. In South East Asia, hundreds of thousands of hectares of forest and other lands were damaged, costing US\$5-10 billion economically and 70 million of the population's health were adversely affected. Moreover, forests all over the world burnt in 1999 have yet to recover, thus indicating that the impact of forest fire on ecology, culture, social and economy is immense (Rowell & Moore, 2000). In addition, a severe drought

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